# Hands-on Scikit-Learn for Machine Learning Applications

Data Science Fundamentals with Python

**David Paper** 

## Hands-on Scikit-Learn for Machine Learning Applications: Data Science Fundamentals with Python

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For my mother, brothers, and friends.

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## **About the Author**



**Dr. David Paper** is a professor at Utah State University in the Management Information Systems department. He is the author of two books – *Web Programming for Business: PHP Object-Oriented Programming with Oracle* and *Data Science Fundamentals for Python and MongoDB*. He has over 70 publications in refereed journals such as *Organizational Research Methods, Communications of the ACM, Information & Management, Information Resource Management Journal, Communications of the AIS, Journal of Information Technology Case and Application Research,* and *Long Range Planning*. He has also served on several editorial boards in various capacities, including associate editor. Besides

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## **About the Technical Reviewer**



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## Introduction

We apply the popular Scikit-Learn library to demonstrate machine learning exercises with Python code to help readers solve machine learning problems. The book is designed for those with intermediate programming skills and some experience with machine learning algorithms. We focus on application of the algorithms rather than theory. So, readers should read about the theory online or from other sources if appropriate. The reader should also be willing to spend a lot of time working through the code examples because they are pretty deep. But, the effort will pay off because the examples are intended to help the reader tackle complex problems.

The book is organized into eight chapters. Chapter 1 introduces the topic of machine learning, Anaconda, and Scikit-Learn. Chapters 2 and 3 introduce algorithmic classification. Chapter 2 classifies simple data sets and Chapter 3 classifies complex ones. Chapter 4 introduces predictive modeling with regression. Chapters 5 and 6 introduce classification tuning. Chapter 5 tunes simple data sets and Chapter 6 tunes complex ones. Chapter 7 introduces predictive modeling regression tuning. Chapter 8 puts all knowledge together to review and present findings in a holistic manner.

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